

## (1) Limpware

### Limpware

**Definition:** Hardware whose performance degrades significantly compared to its specs (a lagging hardware).

#### Anecdotal Impacts:

“... **1Gb NIC** card on a machine that suddenly starts transmitting at **1 Kbps**, making the performance of entire workload for a **100 node cluster** was **crawling at a snail's pace**” – Facebook engineers.

#### A destructive failure mode:

- Cascading failures (entire cluster collapse)
- No “fail in place” recovery

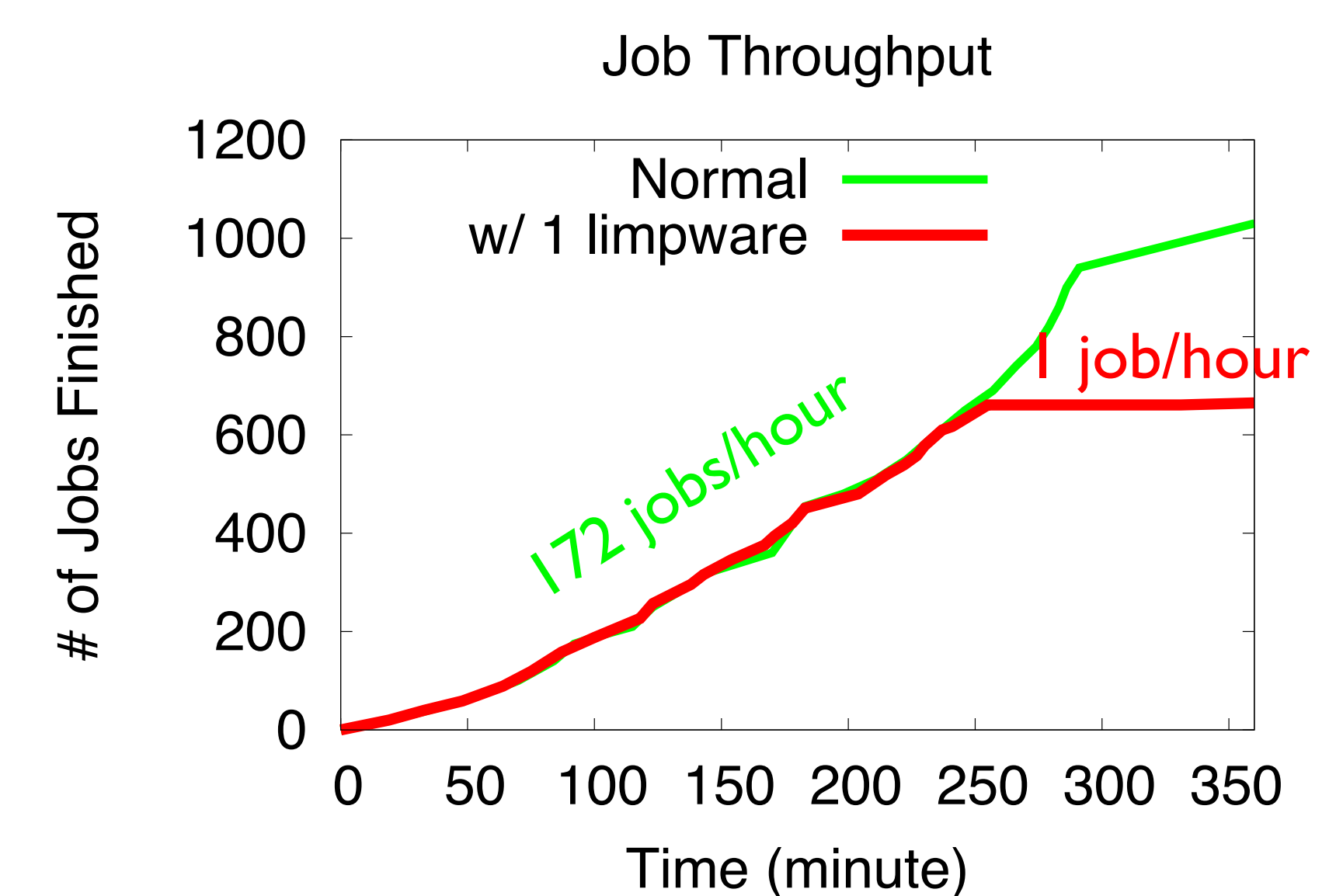
### Our findings

Current cloud systems are *susceptible to limpware*.

A single piece of limpware can cause severe *impact on a whole cluster* [SoCC '13].

System	Operation	Node	Cluster
Hadoop	×	×	×
HDFS	×	×	×
ZooKeeper	×	×	×
Cassandra			
HBase	×	×	

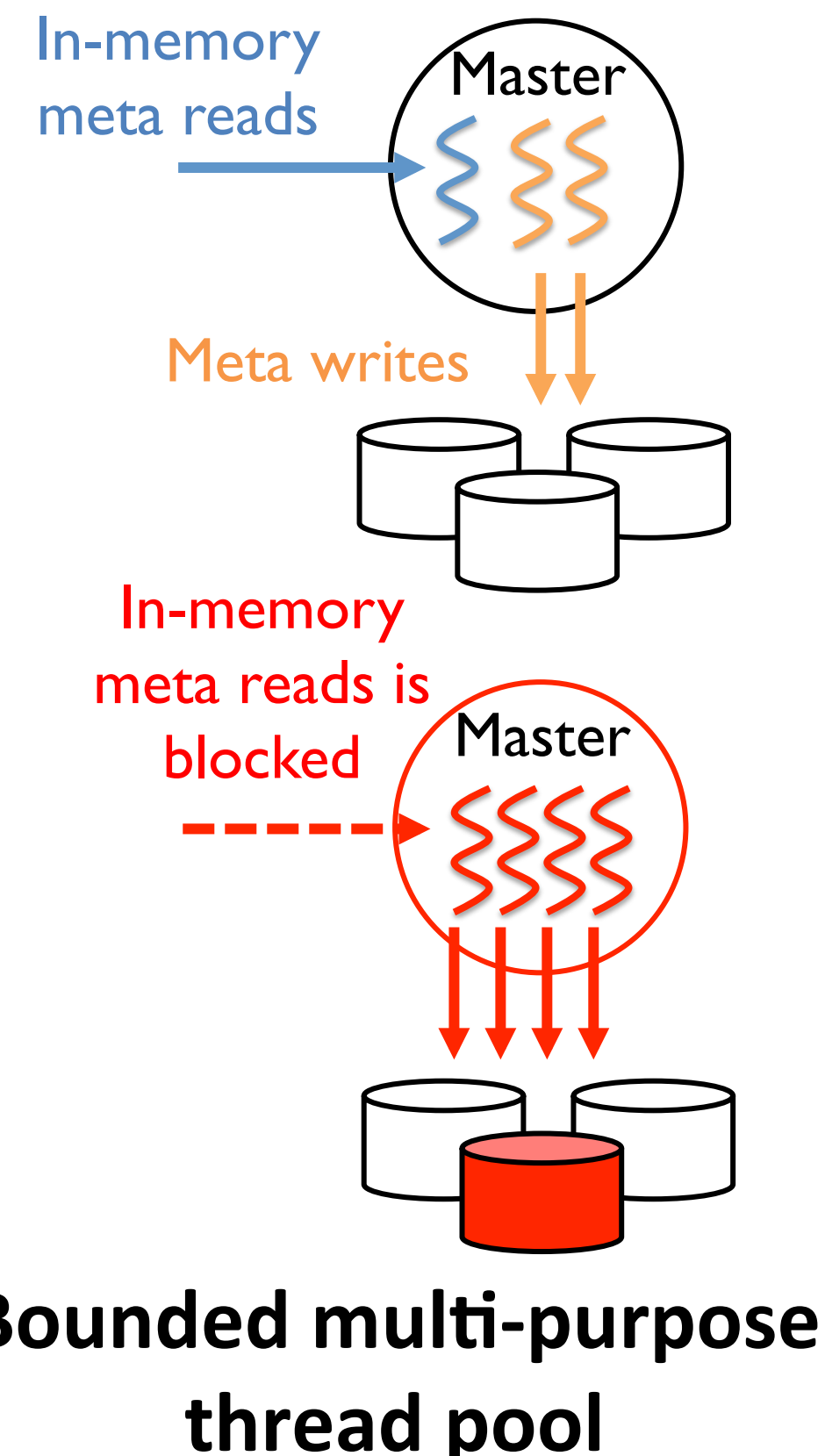
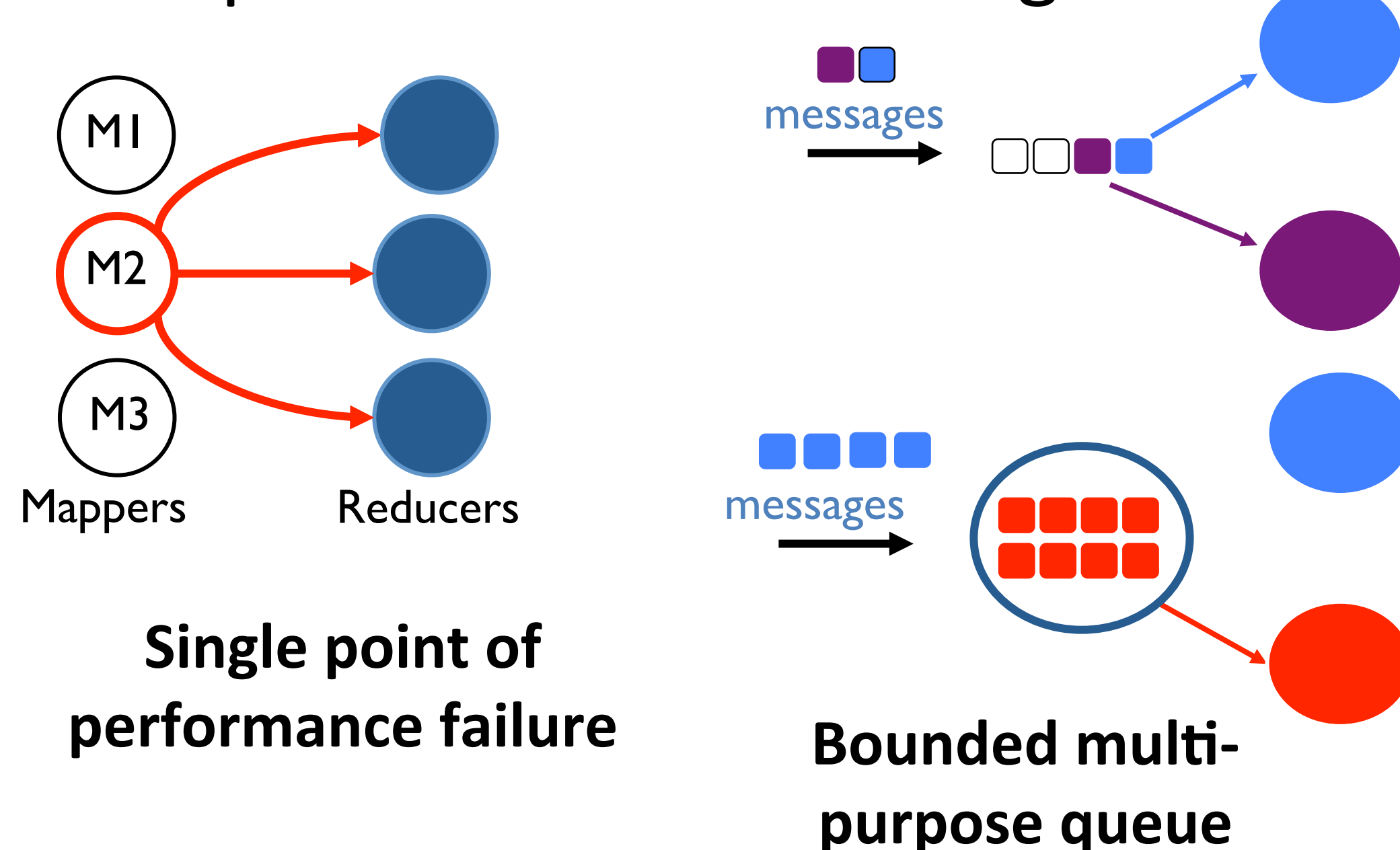
... even Hadoop speculative execution is not triggered!



## Limpware-Intolerant Designs

### Problems:

#### Limpware-Intolerant Designs



### Current work:

#### Pre-deployment Detection of Performance Bugs [HotCloud '15]

- Challenge: Various deployment scenarios such as data locality, data source, job characteristic, job/load size, fault type/placement/granularity/timing, topology scenario, etc.
- Solution: Convert (automatically) complex system code to formal model (CPN). Model check various deployment scenarios

#### Path-Informed Recovery

- Challenge: Limpware is not like fail-stop. Protocol callpath is deep (touches many hardware). Today's recovery sometimes cannot pinpoint the limpware.
- Solution: Ensure multi-layer systems manage paths. Recovery should not take the same slow path.

## (2) The Tail at Store

### Large-scale Study of Storage Performance Variability

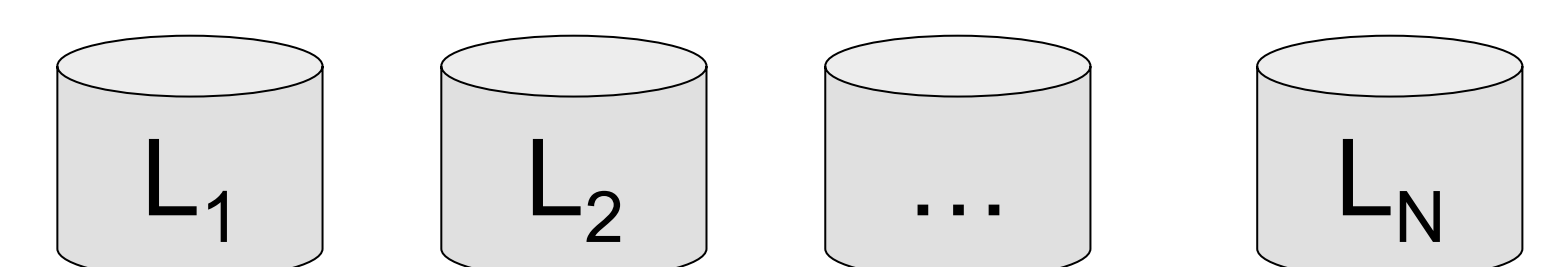
- Study of over **450,000 disks**, **4000 SSDs**, and **240 virtual drives** in deployment.
- More than **800 million drive hours** analyzed.
- (Collaboration with Gokul Soundararajan and Deepak Kenchammana of NetApp)



	Disk	SSD	Virtual
RAID groups	38,029	572	42
Data drives per group	3-26	3-22	3-23
Data drives	458,482	4,069	242
Slow drives (§3.3.4)	118,149	1,195	229
Duration (days)	1-1470	1-94	1-230
Drive hours	857,183,442	7,481,055	211,032
Slow drive hours (§3.3.1)	1,885,804	43,016	37,327
Slow drive hours (%)	0.22%	0.58%	17.7%
RAID hours	72,046,373	1,072,690	56,080
Slow RAID hours (§3.3.2)	1,109,514	23,964	31,230
Slow RAID hours (%)	1.54%	2.23%	55.7%

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Label	Definition
$N$	Number of <i>data</i> drives in a RAID group
$D_i$	Drive number within a RAID group; $i = 1..N$
$L_i$	Hourly average I/O latency observed at $D_i$
$L_{med}$	Median latency; $L_{med} = \text{Median of } (L_{1..N})$
$S_i$	Latency slowdown of $D_i$ compared to the median; $S_i = L_i / L_{med}$
$T^k$	The $k$ -th largest slowdown (“ $k$ -th longest tail”); $T^1 = \text{Max of } (S_{1..N})$ , $T^2 = \text{2nd Max of } (S_{1..N})$ , and so on
Stable	A drive is stable if $S_i < 2$
Slow	A drive is slow if $S_i \geq 2$



## Results

